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#D-A108364 NRL Memorandum Report 4669 E OF REPORT & PERIOD COVERED Preliminary report on a continuing ON DIGITAL PROCESSING VIA PDQ FACTORIZATION NRL problem. 6. PERFORMING ORG. REPORT NUMBER CONTRACT OR GRANT NUMBER(s) 134 116 841 PERFORMING ORGANIZATION NAME AND ADDRESS PROGRAM ELEMENT, PROJECT, TASK AREA & WORK UNIT NUMBERS NRL Problem 79-0719-0-2 Naval Research Laboratory Program Element 61153N14 Washington, DC 20375 RR014024161 11. CONTROLLING OFFICE NAME AND ADDRESS 12. REPORT DATE November 30, 1981 13. NUMBER OF PAGES 13 SECURITY CLASS, (of this report) Unclassified DECLASSIFICATION/ DOWNGRADING SCHEDULE Approved for public release: distribution unlimited. 17. DISTRIBUTION STATEMENT (of the abstract entered in Block 20, if different from Report) 18. SUPPLEMENTARY NOTES 19. KEY WORDS (Continue on reverse side if necessary and identify by block number) Digital images Pictorial database **Approximation Matrices** PDQ factorization ABSTRACT (Continue on reverse elde if necessary and identify by block number) In this preliminary report, we present a computer program called MAT for implementing the PDQ factorization for digitized images of large pictorial data base. Within a mini-computer particular emphasis has been placed on the study of the efficiency of the algorithm in the storage and process of the images.

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ON DIGITAL PROCESSING VIA PDQ FACTORIZATION

I. Introduction

This report discusses a method of compressing data bases that describe large digital images. The ultimate objective of such a procedure is to effect savings in computer memory required to process images and to decrease the amount of data necessary to transmit images over a communication channel.

A digital picture (of photograph or video image) can be represented as a matrix consisting of rectangular blocks of size m x n where m and n are the number of pels (picture elements) in the horizontal and vertical directions, respectively. To process such a picture most effectively (in terms of processing time and quantities of the pictures) by a computer, it is desirable that the main memory of the computer, during the computation, has enough capacity for storage of the entries of the whole image matrix. Unfortunately, this is not the case for most modern minicomputers. Therefore, different adaptive techniques have been devised to cope with this situation. instance, C. B. Moler and G. W. Stewart [2] described a matrix factorization, the so called PDQ factorization technique and applied it to image representation. The factorization is closely related to SVD (singular value decomposition technique developed by H. C. Andrews and C. L. Patterson [1]). The merit of PDQ factorization over SVD is that it requires, during computation, much less arithmetic and the entire maxtrix need not be stored in the main memory.

We have applied the PDQ factorization technique to various digitized pictures, and studied their approximations by different ranks with fixed initial column vector and observed the relationships between initial column vectors P₁ and resolution of the approximated image with fixed rank.

In the implementation of PDQ factorization, we have developed a computer program called MATRXVAX written in Fortran. This program is described in some detail.

II. Analysis of PDQ Factorization

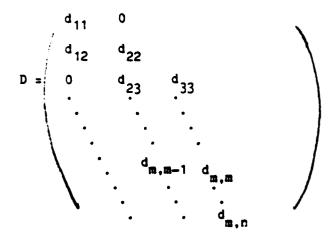
Specifically, the PDQ factorization aims to express a matrix ${\tt A}$ with m rows and n columns as

$$A = PDQ^{T}, (E)$$

Manuscript submitted September 23, 1981.

where P is an m x m orthogonal matrix, Q^{T} is the transpose of Q, and D is a lower bidiagonal matrix, i.e. whose only nonzero entries are

Assume m < n,



In our computer program, each column vector of P and Q is a normalized one. Given a (nonzero) initial column (or column vector) P_1 from A and, one can construct matrices P, D, and Q in (E) by some recursive formulae. The important feature of these recursive formulae is that, during the computations, the columns a_1 , a_2 , —— a_n of A are being referenced sequentially. We also note that, in practice, the inexact arithmetic due to the roundoff error may disturb the orthogonality as well as the normalization. Note that the choice of the initial column P_1 affects the whole structure of P, Q and D. An approximation A_n of A by specific P, Q and D is formed as follows:

$$A_r = P_r D_r Q_r^T,$$

where P_r , Q_r are the matrices formed from the first r columns of P and Q (in (E)), and \tilde{D}_r is the r x r lower bidiagonal matrix with α_i , i = 1,2,...,r on the diagonal and β_i , i = 2, ..., r on the subdiagonal. Clearly A_r is a reduced matrix (of A) of rank $\leq r$.

Moler and Stewart [2] showed, using theoretical studies of the Lanczos algorithm, that A_{Γ} will be a fairly accurate approximation to A even for quite small values of r. If one compares the storage for A and A_{Γ} , their ratio will be

$$R(m, n, r) = \frac{mr + 2r + nr}{mr}$$

Particularly, when m = n, we have

$$R(m, n, r) = \frac{2nr+2r}{n^2}$$

clearly in order to save storage it is necessarily that $2nr < n^2$.

That is

2r < n.

Thus PDQ decomposition will provide significant saving of storage and/or transmitting time if r is chosen much smaller than n.

It seems that, in general, for a matrix of low rank (its corresponding image is of relatively low detail), the PDQ factorization will be effective in processing and restoring the picture. In practice, it is not clear how to choose the value of r in order to have an efficient representation of a picture A_n with less computer storage and processing time. However, from our experiments, so far, $\frac{n}{4}$ seems to be a suitable threshold for the reduced rank r. Of course, the properties that lead to such low numerical rank remain to be studied.

Recall that [1] Andrews defines a condition number $C_R(G) = d_1/d_R$ in the discussion of the potentially efficient representation of the image (picture) in terms of its eigenimages, where G is the original picture (matrix), d_1 is the maximal eigenvalue, and d_k the minimal eigenvalue (\neq 0) in the SVD decomposition for G.

Similarly, we would like to define in PDQ factorization a condition number for reduced matrix of rank k: $C_k(A) = Max\{d_i, g_i, i = 1, 2, ... k\}$,

where
$$d_i = \max\{\alpha_1, \alpha_2, \dots, \alpha_i\}/\min\{(\alpha_1, \alpha_2, \dots, \alpha_i)\}$$

and
$$g_i = \max\{\beta_1, \beta_2, \dots, \beta_i\}/\min\{(\beta_1, \beta_2, \dots, \beta_i)\}$$

A threshold for r values would be a value of k such that both $C_k(A)$ and $C_{k+1}(A)$ as well as their difference are large (of course, here the quantity of largeness remains to be decided). Another way that one may measure the closeness between A and A_r is by defining the quantity

$$D(A, A_r) = 1 - \frac{\sum_{i=1}^{r} |\alpha_i| + \sum_{j=1}^{r-1} |\beta_j|}{\sum_{i=1}^{n} |\alpha_i| + \sum_{j=1}^{n-1} |\beta_j|}$$

Clearly if r = n, then $D(A,A_r) = 0$. Therefore a threshold that one may consider for the approximated value r is to require $D(A,A_r)$ to be sufficiently small. We hope to extend our efforts to include the study of the threshold of r values in our next report.

III. Description of the Matrix Factorization Software.

Because of the limited memory of the NOVA 800, our principal computing tool, factorization of the image matrix is accomplished by the program MATRXVAX running on the VAX 11/780. A formatted image disk file 'MATAF' is created by the program VAXDATA on the NOVA 800 and written onto a magnetic tape by the program MAGTAP using a blocking factor equal to 1. Program MATRXVAX (1) reads the image magnetic tape file into memory on the VAX, (2) factors the image matrix into the matrices P,D and Q^T of specified rank r (3) reconstruct the image PD Q^T onto a magnetic file and (4) writes the matrices P, D and Q^T onto a magnetic tape file.

The image and matrix magnetic tape files created by VAX are written into disk files 'MATAFIN' and 'MATP', respectively, by the Program MAGTAP on the NOVA 800. The program WRTMATAFIN writes the reconstructed image stored in 'MATAFIN' on the COMTAL CRT and the program XCMT writes the COMTAL disk file onto magnetic tape. Images of rank r_i , where $r_i \leq r$ are written either on the COMTAL CRT by the program XMTCT or Optronics C-4300 Colorwriter by the Image Writing Software System PWREC.

IV. Test Results (Pictures)

V. PDQ Factorization for Blurred Images

Denote the original image by A (without loss of generality, we may assume A is a square matrix). Suppose that the noise is modelled by the presence of two unknown matrices N_1 and N_2 such that for any given image A, $B = N_1 A + N_2$ will be the blurred image of A. In order to apply PDQ factorization to A, we first have to determine the two unknown matrices. To do this we use identity matrices I and 2I to define

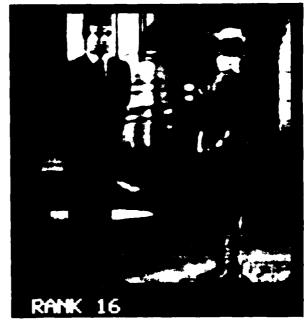
$$B_1 = N_1I + N_2$$
 and $B_2 = 2N_1I + N_2$.

Then B_1 and B_2 are the two known matrices. Therefore $N_1 = B_2 - B_1$ and $N_2 = 2B_1 - B_2$. Once N_1 and N_2 are obtained and stored, then for each blurred image B, we apply N_1^{-1} (B-N₂) (provided that N_1^{-1} exists). We get the original image A and then proceed with PDQ factorization.









VI. Concluding Remarks

The above results will be used for further exploration of the PDQ factorization to digital images. As part of this work efficiency of factorization needs to be improved.

So far, we have seen, through some tests that the PDQ factorization did provide significant saving of storage as well as processing time in the representation of some ordinary pictures. We hope that further research will shed some light on the underlying theory. Our next topics of studies will be (i) properties of images (matrices) whose PDQ factorizations produce good (effective) approximations (i.e., the effective numerically reduced rank r is much less than the rank n of the original matrix, say, rank r less than n/4). (ii) Applying PDQ factorization to the enhancement of the images.

VII. List of Programs

VAXDATA

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CURRENT DIR. YANG

PDOS FILE NAME: VAXDATA
INPUT DATA TO VAX FROM TAPE
PARAMETER N=128, M=256
DIMENSIUN IA(N), P(M), IB(M)
COMMON/PPAP/A, B
DATA A, b/0., 1./
PF(X)=A+X+B
ACCEPT 'MATRIX DIMENSION = ', NA
ACCEPT 'MATRIX RANK = ', NR
CALL OPEN(2, 'MATAF', 2, IER)
WHITE(2, 16) NA, NR

FORMAT(1X,2(I3,1X))
ACCEPT 'TAPE FILE NUMBER = ',NFILE
I2=MA/8
ICNT=0
IF(NFILE.EG.0)GO TO 108

CALL SKFLMT(IER,NFILE)

IGS ILL=0
CALL MEADMT(IER,IA,ILL)
IF(IEM,NE.5)GO TO 120

118 OU 130 J=1,NA 18(J)=6

138 CONTINUE GU TO 125

128 CALL FHLN (IA, IB, NA/2)

38 FORMAT(1x,8(16,2x))
28 CONTINUE
1GNT=1GNT+1
1F(1GNT,EU,NA)GO TO 168
1F(1EK,EG,5)GO TO 118
GU TO 18P

168 CONTINUE DO 50 T=1,NA P(I)=PP(FLOAT(I))

```
K1=(T-1)+8+1
      K2BK1+7
      WHITE (2,76) (P(L),L=K1,K2)
      FORMAT (1x, 8 (F6,8,1x))
78
      CONTINUE
68
      CALL CLOSE (2, IER)
      STOP
      END
                                     ***********************
                                                        MATRXVAX
                                     88/28/81
                                                                 10147146
                                     CURRENT DIR. YANG
                                      ********************
C
      ROOS FILE NAME: MATKXVAX
      MATRIX FACTURIZATION
      PARAMETER Nels, NRR=18
      COMMON/MATR/ G(N, NRR), P(N, NRR), PT(N), QT(N), PTI(N), QTI(N),
     IALPHA (N) . BETA (N) , IAR (N, N) , IA (N, N)
      OPEN (UMIT=21, TYPE= OLD , FILE= 'MATA, DAT')
X
      OPEN (UNIT#23, TYPE# 'NEH ', FILE# 'MATAF, DAT')
      OPEN (UNIT=24. TYPE= 'NEW', FILE= 'MATP, DAT')
      READ (21,469) NA, NR
464
      FURNAT (&(I3,1X))
      DU 420 J=1,256
DU 410 I=1,32
      x1=(I-1)+8+1
      K24K1+7
      REAU (21, 438) ([A(L,J],L=K1,K2)
438
      FORMAT (8(16,2X))
418
      CUNTINUE
424
      CONTINUE
      DO 440 I=1,32
      K1=(1-1)+8+1
      K2=K1+7
      REAC (21,450) (P(L,1),L=K1,K2)
      FURMAT (# (#6.P, 1x))
450
      CONTINUE
440
      BETA(1) ## ..
      SUMBE.
      DU 2 I=1,NA
      Sum = Sum + P (I, 1) + P (I, 1)
      CUNTINUE
      SUMMSURT (SUM)
      DO 4 I=1,NA
P(1,1)=P(1,1)/SUM
      CUNTINUE
      00 28 Im1, NA
      SUM=0.
DD 10 X=1,NA
       SUMBSUM+FLOAT (IA(K, I))+P(K, 1)
      CONTINUE
18
      @([,1] =SUM
28
      CONTINUE
      SUM=8.
       UU 38 ISLANA
      SUM=SUM+Q(I,1)+Q(I,1)
      CONTINUE
38
      ALPHA(1)=SURT(SUM)
      DO 48 IB1, NA
      U(I,1)=U(I,1)/ALPHA(1)
```

50

CONTINUE Du 68 1=1,12

```
48
       CONTINUE
       J=1
       JeJ+1
58
       IF(J.GT.NR)GD TO 230
       DU 70 J2#1.NA
       SUMBU.
       DU 68 K#1, NA
       SUM=SUM+FLOAT(IA(J2,K))+Q(K,J+1)
69
       CONTINUE
       PT (J2) = SUM-ALPHA (J-1) +P (J2, J-1)
79
       CONTINUE
       K2=J-1
       00 100 J2=1,NA
SUM1=0.
       DU 98 K-1,K2
       SUMBR.
00 50 JJ=1, NA
       (X, LL) 9+ (LL) T9+HUZ+HUZ
68
       CONTINUE
       SUM1#SUH1+SUM*P(JZ,K)
94
       CONTINUE
       PTI (J2) =PT (J2) -SUH1
100
       CONTINUE
       SUM#0.
       00 110 I=1,NA
       SUM=SUM+PTI(I)+PTI(I)
119
       CONTINUE
       BETA (J) #SURT (SUM)
       DO 128 I-1, NA
       P(I,J)=PTI(I)/BETA(J)
128
       CONTINUE
       00 170 J2=1,NA
       SUMED,
       00 168 K=1.NA
       SUM#SUM+FLOAT (IA(K,J2)) *P(K,J)
169
       CONTINUE
       QT(J2) = SUM - BETA(J) +Q(J2, J-1)
178
       CONTINUE
       KS#1-1
       DQ 200 J2-1, NA
       SUM1 = 0 .
       DO 198 K#1,K2
       SUM=0.
       AM, 1=LL MB1 DO
       SUM - SUM + QT (JJ) + Q (JJ, K)
180
       CUNTINUE
       SUM1=SUM1+SUM+Q(J2,K)
198
       CONTINUE
       QTI (J2) #QT (J2) -SUM1
249
       CONTINUE
       DU 218 I=1,NA
        SUM = SUM + GTI(I) + GTI(I)
218
       CONTINUE
        ALPHA (J) =SORT (SUM)
       00 228 I=1,NA
       Q(I,J) =QTI(I)/ALPHA(J)
CONTINUE
228
       60 TO 50
       CONTINUE
230
       DG 330 K=1,NA
       00 328 I=1.NA
       Summe.
00 318 Jml.NR
       UM-SUM-P(I,J)+ALPHA(J)+Q(K,J)
IF(J.EQ.1)GC TO 318
IF(J.EQ.1)GC TO 318
IF(J.Y)GC TO 318
316
       CONTINUE
        IAR(I,K)=IFIX(SUM)
       CONTINUE
320
       00 33# J1=1,256
```

```
00 336 11=1,32
      K1=(11-1)+8+1
      K2#K1+7
      #RITE(23,431)(IAR(L,J1),L#K1,K2)
431
      FURMAT(1X,8(10,2X))
330
      CONTINUE
      ACCEPT 348.JYN
      READ(11,344)JYM
      FORMAT ('CONTINUET (1=YES, 8=NO) 1,13)
348
      IF (JYN, EQ. 0) GU TO 360
      ACCEPT 350, NR1
      REAU(11,358) NR1
FORMAT('MATRIX RANK # ',13)
350
368
      CONTINUE
      IZENR/4
      DU 374 I=1,12
      K1=(I-1)+4+1
      *2=K1+3
      WRITE (24,380) (ALPHA (L), L=K1, K2)
      HRITE (24,386) (BETA(LL), LL=K1, K2)
      FORMAT(1X,4(E12,6,1X))
388
370
      CONTINUE
      NK2FNR/4
      00 400 J=1,256
00 400 J=1,NR2
      K1=(I-1)+4+1
      X24K1+3
      WRITE(24,386)(P(J,L),L=K1,K2)
      WHITE (24,388) (Q(J,LL),LL+K1,K2)
488
      CONTINUE
      IF(JYN.LU.M)GO TO 398
      NHENP1
      GO TO 234
398
      CONTINUE
      CLOSE (UNIT#21, DISPCSE# 'DELETE')
      CLOSE (UNIT#23, DISPOSE# 'SAVE')
      CLOSE (UNIT=24, DISPOSE='SAVE')
      STUP
      ENO
                                     *************************
                                                       WRTHATAFIN
                                     08/28/61
                                                                18148117
                                     CURRENT DIR. YANG
                                     ***********************
      RUOS FILE NAME: WRTMATAFIN
      HRITES IMAGE FROM VAX
HOTEL HHEN FORMAT HRITTEN HITH (1X,
                                               XAV OT (
      WORD MUST BE READ WITH NOVA USING (1X, ) FORMAT
       WORD HUST BE READ WITH VAX USING (
                                                ) FORMAT
```

I.E. IX, UELETED FROM FORMAT STATEMENT PARAMETER Me512, Me256
DIMENSION IA(N), IB(M)
CALL OPEN(1, 'MATAFIN', 2, IER)
CALL UPENCT(IER)
ACCEPT 'TO IMAGE # = 1, IDUT
ACCEPT 'TO ISPLAY CODE = 1, ICODE
ACCEPT 'MATRIX DIMENSION = 1, NA
CALL USPL(IER, ICODE)
DU 20 J=1, 256
DU 10 I#1, 32
K1#(I=1) ##+1
K2#K1+7

```
HRITE(14,38) (IA(LL), LL=K1,K2)
30
       FURMAT(1X,8(16,2X))
       DU 40 MeK1.K2
       IF (IA(M).LT.0)IA(M)=6
       IF (IA(M).GT.255) IA(M) =255
40
       CONTINUE
16
       CONTINUE
       CALL PACK (IA, IB, NA)
       CALL HTIMAGE (IER, IOUT, J, IB, -NA/2)
28
       CONTINUE
       CALL CLOSE (1, IER)
STOP
       END
                                                           MATPOTP
                                       08/28/81
                                                                     10:48:39
                                       CURRENT DIR. YANG
                                        *******************************
        HOUS FILE MANESMATPOTP
       IMAGE CONVERSION BY MULTIPLICATION OF P.Q AND D
       MATRIX MANK NEG RUN ON YAX HUST BE MULTIPLE OF 4
       PARAMETER No.1024, M=2848, NN=256, NM=128
       DIMENSION P(N),Q(N),ALPMA(NN),BETA(NN),IA(NN),IB(NM)
       COMMON/INTS1/IP(M)
       COMMON/INTS2/10(M)
       EUUIVALENCE (IP(1),P(1)),(IQ(1),Q(1))
       ACCEPT 'NEW RUNT (1-YES, 8-NO) - ', JYN
       ACCEPT 'MAX MATRIX RANK NRS . I, NRS
       ACCEPT !MATRIX RANK - 1,NR
       ACCEPT 'TO MTOS!, IFL
       CALL OPEN (3, MATPI, 2, IER)
       NLINES-1724/NRG
       NTRANSBNK#/4
       NHDS=1824
       NULKSES
       IZHNRU/4
       00 30 I=1,12
       K1=(I=1]-4+1
       K2=K1+3
       READ (3,24) (ALPHA (L), L=K1, K2)
       READ (J, 28) (BETA (L), L=K1, K2)
       FORMAT(1x,4(E13.8,1x))
28
30
       CUNTINUE
       IF(JYN.E0.0)G0 TO 32
       CALL CFILH ('PMAT', 3, 206, IER)
IF (IER. NE. 1) TYPE 'FILE ERROR'
       CALL CFILM ('OMAT', 3, 208, IER)
IF (IEH, NE. 1) TYPE 'FILE ERROR 2'
       CALL OPEN(1, PHATI, 2, IER)
32
       CALL OPEN (2, 'QMAT', 2, 1ER)
       IF (JYN.EG.0)GQ TO 52
       IMAX=NHDS/4
       DO SE JEL, NTRANS
       DO 40 I=1, IMAX
       K1=(I=1]=4+1
       K2=K1+3
       READ (3,28) (P(L), L=K1, K2)
       REAU (3,28) (@(LL),LL=K1,K2)
48
       CUNTINUE
       CALL MMOLK (1, (J-1) +NOLKS, IP, NOLKS, IER)
       CALL #RBLK(2, (J-1) + MBLKS, IQ, MBLKS, IER)
TYPE 'IP(I), I=1, 32 ', (IP(IXX), IXX=1, 32)
       TYPE '10(1),1=1,32',(10(1xxx),1xxx=1,32)
```

READ(1,30)(IA(L),L=K1,K2)

```
CONTINUE
52
      CUNTINUE
      CALL RLSE ('MTO', IER)
      CALL INIT ('MTH', IER)
IF (IFL.EG.0)GO TO 20F
      CALL SKFLMT (IER, IFL)
      CONTINUE
200
      DO 160 A=1, NTRANS
      CALL ROBLK(2, (K-1)+NBLKS, IQ, NBLKS, IER)
      DU 160 K1=1, NLINES
      KJ=(K1-1)+NKR
      11=4
      DU 15r I=1, NTRANS
      CALL ROBLE (1, (1-1) +NBLKS, IP, NBLKS, IER)
      DO 156 I1-1, NLINES
       IJ=(I1-1)+NR6
       SUMBY.
      00 140 J#1,NR
       SUMESUM+P(IJ+J)+ALPHA(J)+U(KJ+J)
       IF (J.EQ.1)GU TO 148
       SUM=SUM+P(IJ+J)+BETA(J)+Q(KJ+J=1)
       CUNTINUE
140
       IlelI+1
       IA(11)=IFIX(SUM)
       IF (1A(11).LT.0) [A(11)=0
       IF(1A(I1).GT.255) IA(II)=255
       CONTINUE
150
       CALL PACK(IA, IB, 256)
       CALL #RITHT(IER, 18,-128)
       CUNTINUE
169
       CALL MTENDF (IER)
CALL CLOSE (1, IER)
       CALL CLUSE (2, IER)
       CALL CLUSE (3, TER)
       CALL RESE('MT8', IER)
       STOP
       END
```

Acknowledgement

We would like to thank Dr. Warren W. Willman for his assistance in running the program MATXVAX on VAX 11/780. Also thanks to Dr. Igor Jurkevich for his helpful suggestions as to the form of this report.

References

- [1] H. C. Andrews and C. L. Patterson, Outer product expansion and their uses in Digital Image Processing, Amer. Math. Monthly, Vol. 1, No. 82, June 1975, pp. 1-13.
- [2] C. B. Moler & G. W. Stewart, An Efficient Matrix Factorization for Digital Image Processing, LASL Tech. Report, LA-7637-MS, 1979.

